# Purdue MSE597G Lectures on Molecular Dynamics simulations of materials

# Lecture 3 Statistical Mechanics II

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# Molecular Dynamics simulations

#### **Introduction**

- •What is molecular dynamics (MD)? Examples of current research
- •Why molecular dynamics?

### **Part 1: the theory behind molecular dynamics**

- •Basic ideas & algorithms
- •Brief introduction to the physics necessary to run & understand MD

#### Part 2: total energy and force calculations

- •Quantum mechanical origin of atomic interactions
- •Inter-atomic potentials: "averaging electrons out"

### Part 3: advanced techniques, mesodynamics, verification and validation

- •MD in under isothermal and isobaric conditions
- •Coarse grain approaches and dynamics with implicit degrees of freedom
- •Before you perform production runs
- •Tutorial to perform MD simulations using the nanoMATERIALS simulation tool at the nanoHUB
- Homework exercises

# Various important ensembles

 $P(\{r_i\}\{p_i\}) = \frac{1}{\Omega(E,V,N)} \qquad P(\{r_i\},\{p_i\}) = \frac{e^{-\frac{H(\{r_i\},\{p_i\})}{kT}}}{Z(T,V,N)} \qquad P(\{r_i\},\{p_i\},V) = \frac{e^{-\frac{1}{kT}[H(\{r_i\},\{p_i\})-PV]}}{Z_P(T,P,N)}$ 

Free energies (atomistic ↔ macroscopic thermodynamics)

 $S = k \log \Omega(E, V, N) \qquad F(T, V, N) = -kT \log Z \qquad G(T, P, N) = -kT \log Z_p$ 

Microcanonical (NVE) Canonical (NVT) Isobaric/isothermal (NPT)

 $Z(T,V,N) = \sum_{micro} e^{-\frac{E}{kT}} \qquad Z_P(T,P,N) = \sum_{V} \sum_{micro} e^{-\frac{E-PV}{kT}}$ 

 $\Omega(E,V,N)$ =

 $\sum_{micro} \delta(E - H(\lbrace r_i \rbrace \lbrace p_i \rbrace))$ 

Probability distributions

# Canonical ens.: equipartition of energy

Consider a variable that appears squared in the Hamiltonian:

$$H(\lbrace r_i \rbrace, \lbrace p_i \rbrace) = \lambda p_1^2 + V(\lbrace r_i(t) \rbrace) + \sum_{i=2}^{3N} \frac{p_i(t)^2}{2m_i} = \lambda p_1^2 + H'$$

$$\left\langle \lambda p_{1}^{2} \right\rangle = \frac{\int d^{3N} p \, d^{3N} p \, \lambda p_{1}^{2} e^{-\frac{H(\left\{r_{i}\right\}, \left\{p_{i}\right\})}{kT}}}{\int d^{3N} p \, d^{3N} p \, e^{-\frac{H(\left\{r_{i}\right\}, \left\{p_{i}\right\})}{kT}}} = \frac{\int d^{3N} p \, d^{3N-1} p \, e^{-\frac{H'}{kT}} \int dp_{1} \lambda p_{1}^{2} e^{-\frac{\lambda p_{1}^{2}}{kT}}}{\int dp_{1} e^{-\frac{\lambda p_{1}^{2}}{kT}}}$$

Change of variable: 
$$\frac{\lambda p_1^2}{kT} = x^2$$
  $dp_1 = \frac{kT}{\lambda} dx$ 

$$\left\langle \lambda p_1^2 \right\rangle = \frac{\frac{(kT)^2}{\lambda} \int dx \ x^2 \ e^{-x^2}}{\frac{kT}{\lambda} \int dx \ e^{-x^2}} = \frac{1}{2} kT$$

**Equipartition of energy**: Any degree of freedom that appears squared in the Hamiltonian contributes 1/2kT of energy

### Equipartition of energy: MD temperature

$$\langle K \rangle = \frac{3N}{2}kT$$

In most cases c.m. motion is set to zero at time zero (constant of motion  $\rightarrow$  it remains zero)

$$\langle K \rangle = \frac{3N-3}{2}kT$$

Often angular momentun is zeroed (and remains zero)

$$\langle K \rangle = \frac{3N - 6}{2}kT$$

Temperature is related to **average** kinetic energy. Instantaneous temperature:

$$K(t) = \frac{N_{eff}}{2} kT(t)$$

## **Fluctuations**

Fluctuations from equilibrium are also related to materials properties

$$\langle \delta A^2 \rangle = \frac{1}{\tau} \int_0^\tau \left[ A(t) - \langle A \rangle \right]^2 dt = \langle A^2 \rangle - \langle A \rangle^2$$

### **Specific heat:**

$$C_{V} = \frac{\partial E}{\partial T} \bigg|_{NVT}$$

$$\left\langle \delta H^2 \right\rangle_{NVT} = kT^2 C_V$$

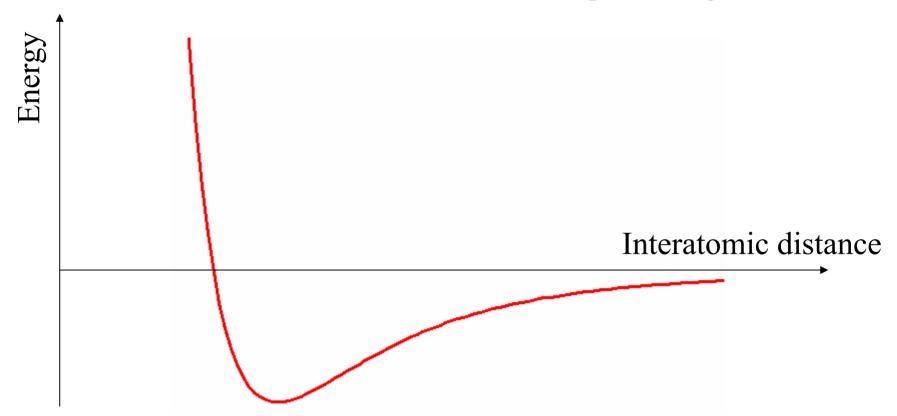
### **Compressibility:**

$$\beta_{V} = \frac{1}{V} \frac{\partial V}{\partial P} \bigg|_{NVT}$$

$$\left\langle \delta V^2 \right\rangle_{NPT} = k \left\langle V \right\rangle T \beta_T$$

# Quantum effects

When does classical mechanics for atoms stop working?



Temperature at which quantum effects kick in depends on frequency

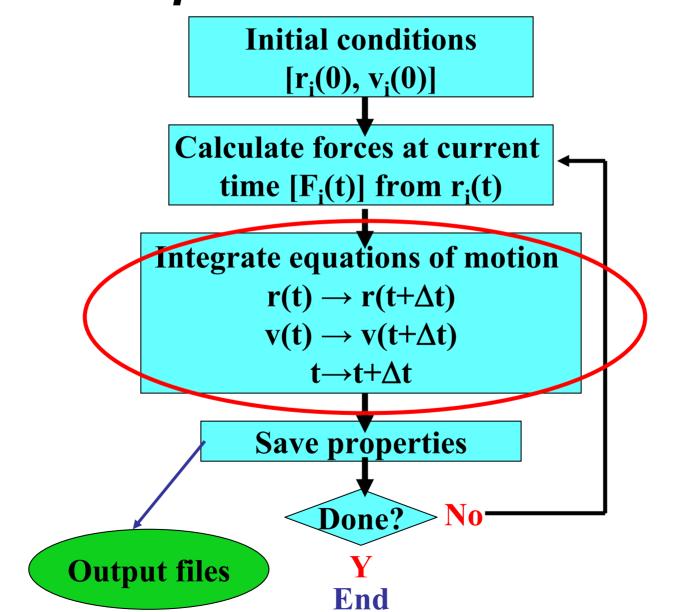
 $kT \gg \hbar\omega$  Classical regime

 $kT \sim < \hbar \omega$  Quantum regime

# Statistical mechanics: further reading

- •Kerson Huang: "Statistical Mechanics"
- •Landau and Lifshitz: "Course of Theoretical Physics Volume 5: Statistical Physics"
- •Balescu: "Equilibrium and nonequilibrium statistical mechanics"

# How do we numerically integrate the equations of motion?



# Integrating the equations of motion

$$\dot{\vec{r}}_i = \frac{\vec{p}_i}{m_i}$$

$$\dot{\vec{p}}_i = \vec{F}_i$$

Verlet algorithm: Taylor expansion of positions with time

$$r_i(t + \Delta t) = r_i(t) + \dot{r}_i(t)\Delta t + \frac{1}{2}\ddot{r}_i(t)\Delta t^2 + \frac{1}{6}\ddot{r}_i(t)\Delta t^3 + O(\Delta t^4)$$

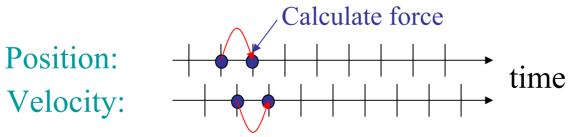
$$r_i(t - \Delta t) = r_i(t) - \dot{r}_i(t)\Delta t + \frac{1}{2}\ddot{r}_i(t)\Delta t^2 - \frac{1}{6}\ddot{r}_i(t)\Delta t^3 + O(\Delta t^4)$$

Sum two equations:

# Verlet algorithm: various equivalent formulations

Velocity Verlet:  $\begin{cases} p_i \left( t + \frac{1}{2} \Delta t \right) = p_i(t) + \frac{1}{2} F_i(t) \Delta t & \text{Advance } p \text{ half step} \\ r_i(t + \Delta t) = r_i(t) + \frac{p_i \left( t + \frac{1}{2} \Delta t \right)}{m_i} \Delta t & \text{(with } p \text{ half step ahead)} \\ p_i(t + \Delta t) = p_i \left( t + \frac{1}{2} \Delta t \right) + \frac{1}{2} F_i(t + \Delta t) \Delta t & \text{Advance } p \text{ half step} \\ \text{(with } F \text{ at } t + \Delta t) \end{cases}$ 

Leap-Frog Verlet: 
$$\begin{cases} r_i \left( t + \frac{1}{2} \Delta t \right) = r_i \left( t - \frac{1}{2} \Delta t \right) + v_i(t) \Delta t \\ v_i \left( t + \Delta t \right) = v_i(t) + \frac{1}{m_i} F_i \left( t + \frac{1}{2} \Delta t \right) \end{cases}$$



# Verlet algorithm: features and advantages

- •Exactly time reversible
  - •If velocities are reversed at a given time the algorithm traces back its steps
- Symplectic
  - •Conserves volume in phase space (as Hamiltonian dynamics does)



- •No long-term energy drifts
- •The trajectory stays very close to the constant energy hypersurface in phase space

Remember:  $S = k \log \Omega(E, V, N)$ 

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### Part 2: total energy and force calculations

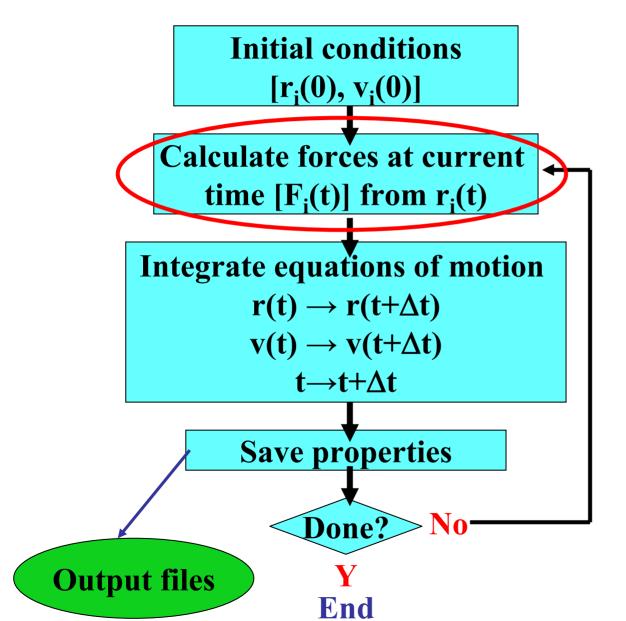
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### Part 3: advanced techniques, mesodynamics, verification and validation

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### How do we calculate atomic forces?



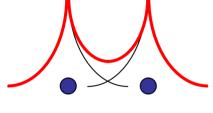
# The simplest molecule: $H_2^+$

• electron (e<sup>-</sup>)

proton

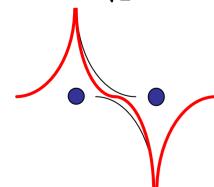
Molecular wave function as linear combination of atomic orbitals (LCAO)

$$\psi_{sym}(\vec{r}) = \frac{1}{\sqrt{2}} (\psi_L(\vec{r}) + \psi_R(\vec{r}))$$

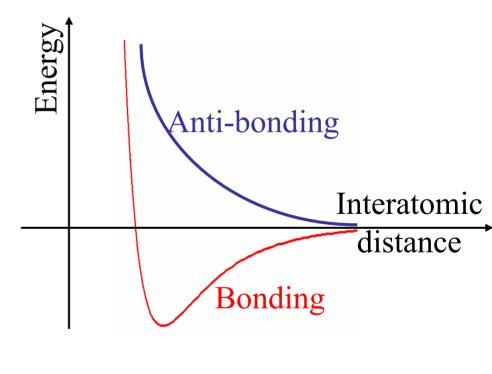


- •K.E. good
- •P.E. not so good
  - •Bonding

$$\psi_{asym}(\vec{r}) = \frac{1}{\sqrt{2}} (\psi_L(\vec{r}) - \psi_R(\vec{r}))$$

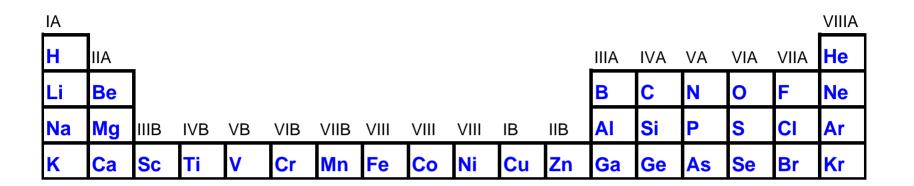


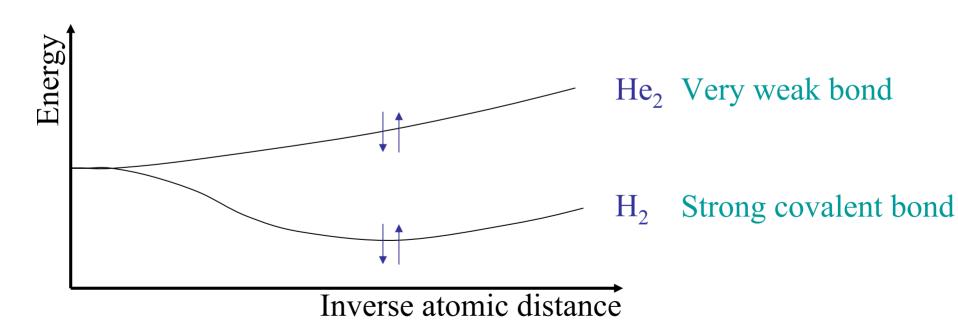
- •K.E. not so good
- •P.E. good
- •Anti-bonding



proton

### Covalent and non-bond interactions





### How can we compute interatomic potential?

- Ab initio electronic structure methods
  - •Hartree Fock, Density Functional Theory
  - Quantum Monte Carlo
  - •Very accurate but computationally intensive (applicable to small systems 100s-1000s atoms)

### •Interatomic potentials:

$$V(\lbrace r_i \rbrace) = V_{\text{cov/met}}(\lbrace r_i \rbrace) + V_{electr}(\lbrace r_i \rbrace) + V_{vdW}(\lbrace r_i \rbrace)$$

Parameterized to describe specific materials

- •Ab initio data
- •Experiments